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Genetic tropicalisation following a marine heatwave

Melinda A. Coleman^{1,2,3✉}, Antoine J. P. Minne^{2,3}, Sofie Vranken³ & Thomas Wernberg^{3,4}

Extreme events are increasing globally with devastating ecological consequences, but the impacts on underlying genetic diversity and structure are often cryptic and poorly understood, hindering assessment of adaptive capacity and ecosystem vulnerability to future change. Using very rare “before” data we empirically demonstrate that an extreme marine heatwave caused a significant poleward shift in genetic clusters of kelp forests whereby alleles characteristic of cool water were replaced by those that predominated in warm water across 200 km of coastline. This “genetic tropicalisation” was facilitated by significant mortality of kelp and other co-occurring seaweeds within the footprint of the heatwave that opened space for rapid local proliferation of surviving kelp genotypes or dispersal and recruitment of spores from warmer waters. Genetic diversity declined and inbreeding increased in the newly tropicalised site, but these metrics were relative stable elsewhere within the footprint of the heatwave. Thus, extreme events such as marine heatwaves not only lead to significant mortality and population loss but can also drive significant genetic change in natural populations.

Climate change is increasing the intensity and frequency of extreme events^{1,2} with significant impacts to species and ecosystems on both evolutionary and contemporary time scales³. Because extreme events, by definition, exceed normal environmental conditions, they drive significant mortality, range shifts and the transition to novel ecosystem states^{4–6}. However, in contrast to the ecological impacts of extreme climatic events which are often obvious and well documented, their impact on underlying patterns of genetic diversity and structure and the implications for adaptability to future change is obscure and often unknown^{3,7–10}, particularly for marine systems.

Marine heatwaves are extreme events defined as discrete periods of anomalously warm-water that exceed historical norms of ocean temperature¹¹ and are superimposed on a background of ocean warming. Marine heatwaves are increasing in frequency and duration globally¹² with significant consequences for coastal marine species, communities and the ecosystem services they provide^{13–17}. While we have an emerging understanding of how ocean warming may affect the genetics of marine species e.g.^{18,19}, there are few empirical studies demonstrating the genetic impact of extreme marine heatwaves (but see^{20,21}). One of the most severe marine heatwaves ever recorded impacted ~2,000 km of coast off Western Australia in 2011²², where sea temperatures soared up to 5.5 °C above normal for several weeks Fig. 1^{23,24}. The heatwave precipitated widespread and significant local extinction and range contraction of entire marine communities^{6,24,25}, shifts in ecological structure^{6,26} and impacted fisheries²⁷ significantly compromising the vast ecosystem goods and services along this coastline²⁸.

Marine forests, comprised of foundation species of kelps and seaweeds that underpin biodiversity throughout temperate regions^{28–30}, have been heavily impacted by marine heatwaves globally^{13–17} and were most heavily impacted by the 2011 Western Australian heatwave⁶. Vast underwater forests of the common kelp (*Ecklonia radiata*, hereafter referred to as *Ecklonia*, Fig. 1) were impacted by the heatwave with direct loss of kelp varying from complete local extirpation at its low latitude (warm) range edge (Kalbarri), 25–50% loss at mid latitudes and little loss at higher latitudes (Fig. 2, 10). Subsequently, ecological communities at low and mid latitude reefs became “tropicalised”²⁴ whereby the occurrence of warm-affinity species increased, shifting the entire biotic community (species compositions) to more closely resemble tropical latitudes and transforming them into novel ecosystem configurations⁶ following the heatwave. Although there is some suggestion that low genetic diversity of *Ecklonia* populations prior to the heatwave may have mediated its ecological impact¹⁰, the consequence of the heatwave for subsequent genetic diversity and structure of *Ecklonia* forests is currently unknown. Given that

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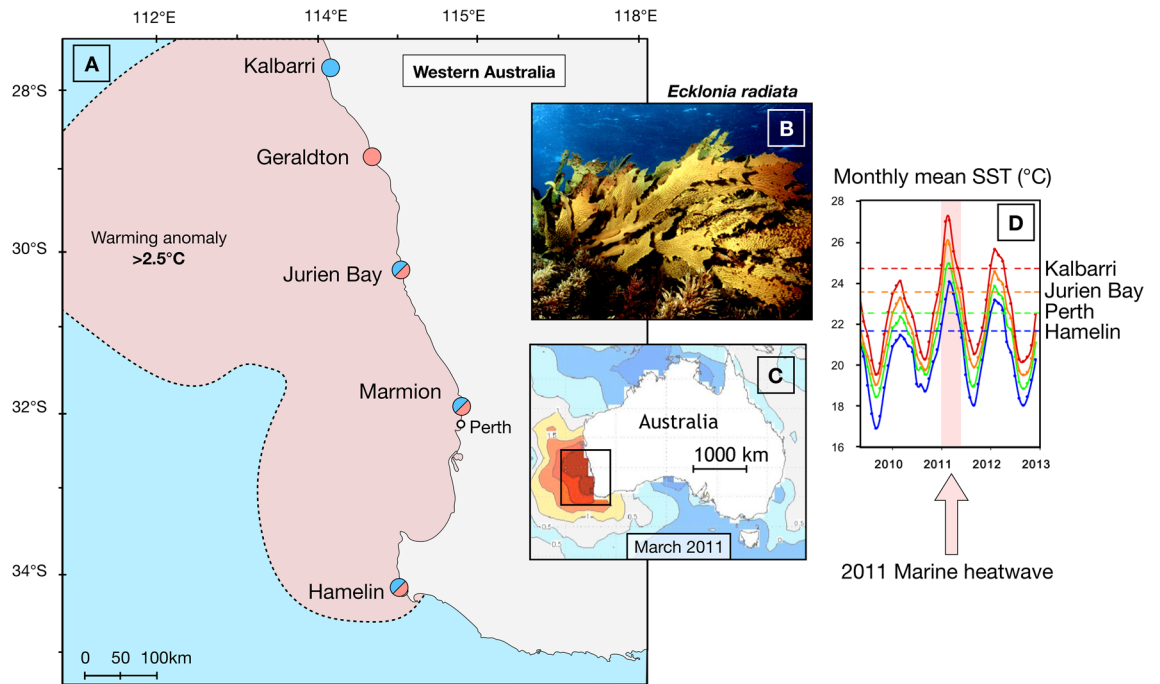


Figure 1. Sampling locations with footprint of the marine heatwave (red) and surface temperature anomaly reported from March 2011 compared to 1971–2000 surface temperature records²⁴ (A), photo of *Ecklonia radiata* (B) and details of the regional evolution of the temperature anomaly (C) and at each of our study sites (D)¹⁰.

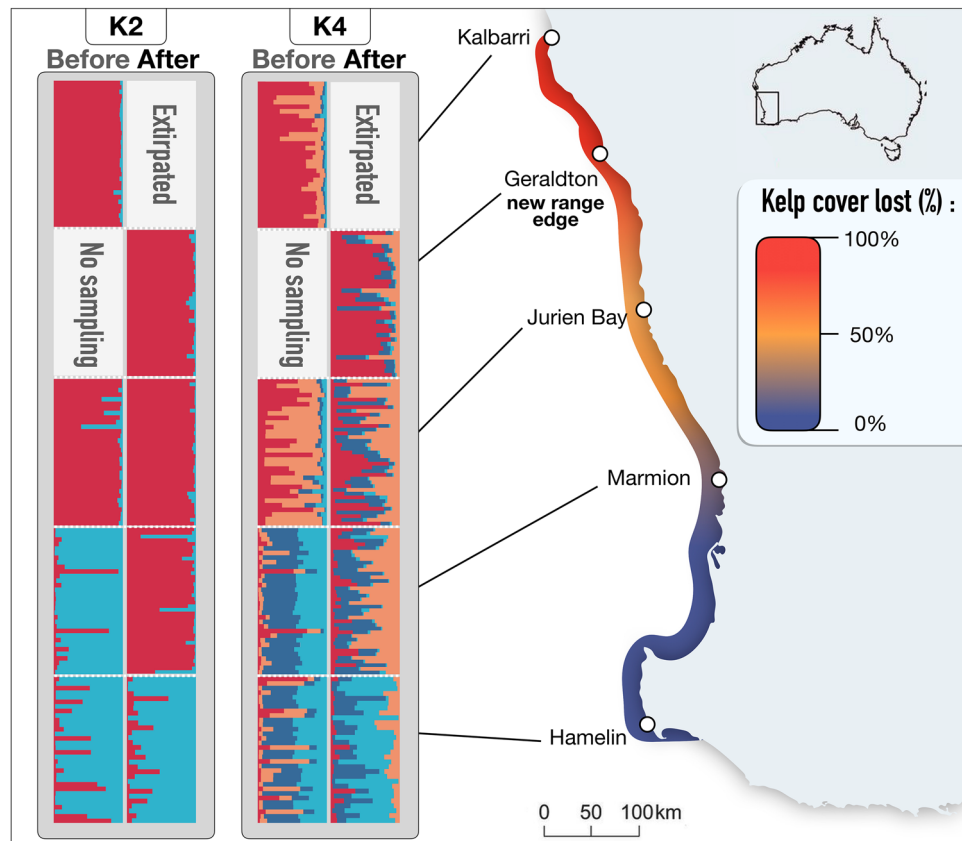


Figure 2. Population genetic structure inferred by STRUCTURE (v 2.3.4; <https://web.stanford.edu/group/pritchardlab/structure>) analysis for the K = 2 genetic clusters before and after the heatwave. K = 4 is also shown to better visualise admixture. Each horizontal line represents an individual coloured according to that individual's membership assigned to each cluster. The gradient coloured line represents the kelp cover lost⁶.

co-occurring kelp species suffered cryptic loss of genetic diversity and potential directional selection following the heatwave²⁰ it is possible that *Ecklonia* populations were similarly affected. Unravelling whether the heatwave caused genetic changes in *Ecklonia* forests will help predict vulnerability to future warming and extreme events.

Because extreme events are largely unpredictable in time and space, robust empirical assessment of their impacts are often hindered by a lack of “before data”³. We were fortunate to have genetic samples (DNA) of *Ecklonia* forests prior to the heatwave, allowing us to provide a rare empirical demonstration of the impacts of an extreme marine heatwave on subsequent genetic properties of kelp forests. We predicted that the heatwave would precipitate loss of genetic diversity given the large mortality of *Ecklonia* at many sites and a poleward shift in warm-affinity alleles driven by an increased flow of prevailing currents during the reproductive period of *Ecklonia* immediately following the heatwave³¹.

Materials and methods

Marine heatwave and study species. In the Austral summer of 2010/11 the west coast of Australia experienced an unprecedented marine heatwave (MHW) with temperature anomalies exceeding anything seen in at least 140 years of recorded history Fig. 1²⁴. The MHW engulfed ~ 2,000 km coastline and on the southwest coast, where this study was focused, the coastal region experienced temperature anomalies of 2.5–5.5 °C above the long term maxima (dotted lines; Fig. 1) for more than 10 weeks Fig. 1^{23,24}. The prevailing poleward current (Leeuwin current) was also stronger during the autumn reproductive period of *Ecklonia*³¹ immediately following the heatwave.

Ecklonia radiata is the dominant kelp throughout Australasia³⁰ where it underpins immense biodiversity^{32,33}. It is a perennial species with an alternation of generations life cycle with macroscopic sporophytes (sampled here) alternating with microscopic gametophytes³⁰. *E. radiata* does not reproduce asexually, except for the distinctive *E. brevipes* morphotype in Hamelin Bay³⁴ which was not sampled here. Samples of *E. radiata* sporophytes for genetics were collected across 800 km of coastline that experienced the highest thermal anomalies during the heatwave (up to 5.5 °C at Jurien Bay, Fig. 1)^{10,24}. Samples were collected both before (2006)³⁵ and after (2018) the 2011 heatwave from Kalbarri (old range edge, before only), Geraldton (new range edge, after only), Jurien Bay, Marmion and Hamelin. There were no large thermal anomalies in the intervening years except a mildly cooler period from 2015 to 2017. We recognise that our sampling represents only 2 points in time and without more temporal replication within before and after periods we cannot definitively attribute any genetic change to the heatwave. However, we believe that the rarity of “before” genetic data in studies that seek to examine impacts of unpredictable extreme events warrants this sampling design (see^{8,9,36,37} for examples of similar designs with 2 time points for genetic data). Moreover, given that temporal replication of genetic data in any study is rare, our data is a critical first step in assessing genetic impacts of climatic change on natural systems. Both before and after the heatwave, all samples were haphazardly collected (but at least 1 m apart) on scuba or snorkel between two and ten meters depth in an area approximately 20 × 20 m³². Collected samples ($n = 30$ –40 kelp plants per site) were free from epiphytes and were preserved in silica gel desiccant (2006) or snap frozen in liquid nitrogen (2018).

Microsatellite genotyping and analysis. DNA from 2006 was extracted as in^{35,38,39} and in 2018 using Qiagen DNeasy plant kits and cleaned with Qiagen Powerplant Pro kits using a modified manufacturer protocol. Specifically, raw material was soaked in lysis buffer for 24–48 h at 65 °C to aid lysis and DNA was washed on the spin filter 3 times. DNA quality and quantity were checked using picogreen and gel electrophoresis (2006) or on a Qubit and Nanodrop the run on a LabChip nucleic acid analyser (Perkin Elmer) for quality control. Even DNA samples from 2006 (stored in sealed 96 well plates in a – 20 freezer) that had a lower concentration of DNA amplified well. All DNA samples were genotyped at the same time (in 2019) using $n = 8$ new polymorphic microsatellite markers developed for *E. cava*⁴⁰ and *E. radicata*⁴¹ and tested on *E. radiata* (supplementary Table S1). Microsatellites were chosen because the DNA from 2006 was of lower quantity and not suitable for RADSeq approaches that require a much larger quantity and exemplary quality of DNA. PCRs comprised a total reaction volume of 10 µl comprising 0.5 µl of template DNA (with 1:80 dilutions for most samples), 5 µl of Taq polymerase (Invitrogen Platinum II Hot Start 2 U/µl supplied by Thermo Scientific), 0.2 µl of each primer (10 µM) and 4.1 µl ddH₂O. PCRs were run on an Eppendorf Thermal Cycler (Mastercycler nexus) programmed for a 2-step protocol composed of an initial denaturation at 94 °C for 2 min followed by 30 cycles each with denaturing at 98 °C for 5 s, annealing/extension at 60 °C for 15 s. Recalcitrant amplifications were repeated using MyTaq Hot Start Taq polymerase (reaction volume of 10 µl comprising 1 µl of template DNA, 5 µl of Taq polymerase (MyTaq Hot Start supplied by Bioline), 0.4 µl of each primer (10 µM) and 3.2 µl ddH₂O). PCR conditions were composed of an initial denaturation at 95 °C for 1 min followed by 30 cycles each with denaturing at 95 °C for 15 s, annealing at 59 °C for 15 s and extension at 72 °C for 10 s. Fragment sizes were genotyped by capillary separation at the Australian Genome Research Facility using one individual with known genotype for each loci to avoid reading errors on all sequenced plates.

Allele sizes were manually scored using the microsatellite plugin on the Geneious Prime software (v11.1). Ambiguous loci were classed as missing data. Prior to conducting statistical analyses, we checked for genotyping errors (null alleles, stutter, allele drop out and typographical errors) using MICRO-CHECKER⁴². No evidence of null alleles or scoring errors due to stuttering or large allele dropout was found in the whole data set. Overall, no more than 4% of missing data was allowed within a year with a maximum of 10% of missing data for one population across loci and 8.75% for one locus across populations. We tested for linkage disequilibrium between pairs of loci of the populations in ARLEQUIN 3.5⁴³ with a permutation procedure of 10,000 iterations. We found no consistent linkage disequilibrium between loci across populations, instead the standardised index of association (implemented in the package *poppr* using 999 permutations⁴⁴ revealed significant linkage between markers only in Geraldton after the MHW ($P \leq 0.01$) which may be a result of the significant population declines in this

Location	N		N _a		A _r		N _p		H _o		H _e		MLH		F _{IS}		H deficiency	
	Before	After	Before	After	Before	After	Before	After	Before	After	Before	After	Before	After	Before	After	Before	After
Kalbarri	32		28		3.500		1		0.397		0.388		0.386		-0.004		0.422	
Geraldton		33		38		4.750		2		0.365		0.388		0.360		0.076		0.039
Jurien Bay	32	39	42	43	5.250	5.375	5	4	0.416	0.509	0.441	0.493	0.418	0.508	0.073	0.131*	0.148	0.234
Marmion	32	40	46	45	5.750	5.623	7	6	0.52	0.359	0.509	0.386	0.521	0.359	-0.005	0.148*	0.098	0.004
Hamelin	32	30	44	50	5.500	6.250	6	7	0.491	0.505	0.500	0.521	0.479	0.516	0.034	-0.006	0.320	0.230
Total	128	142	67	68	5.000	5.100	19	19	0.471	0.417	0.463	0.437	0.451	0.433	0.025	0.078	0.247	0.127

Table 1. Metrics of genetic diversity before (blue) and after (red) the marine heatwave. N number of samples, N_a the total number of alleles, A_r the allelic richness, N_p the number of private alleles, H_o observed heterozygosity, H_e expected heterozygosity, MLH mean number of heterozygous loci per individual. F_{IS}=inbreeding coefficient and H deficiency is the P value for test of heterozygote deficiency indicative of a population expansion. No data was available at Kalbarri after the heatwave because populations of *Ecklonia* were extirpated. Instead, the new range edge (Geraldton) was sampled after the heatwave.

site, however, no data was available from prior to the MHW. Departure from panmixia was tested at each locus for each population using the function *hw.test* implemented in the package *Pegas* with the conventional Chi-square test. Significance of the deviation from Hardy–Weinberg equilibrium was addressed by a Markov Chain (MC) algorithm in ARLEQUIN (exact test by Guo and Thompson⁴⁵ tested locus-by-locus (MC: 1,106 steps; dememorization: 1,105 steps) but departure was never found for more than one locus in each population. The total number of alleles or allelic richness (Na) per locus, the observed (Ho) and expected (He) heterozygosity and the number of private alleles (unique to a particular site) were estimated for each population before and after the MHW using GENALEX 6.5⁴⁶ and GENETIX 4.05⁴⁷ also used to estimate pairwise Weir and Cockerham’s F_{ST}. MLH (multi-locus heterozygosity or the mean number of heterozygous loci per individual) was calculated using the R package *InbreedR* at each site before and after the heatwave as this metric has previously been shown to be a sensitive metric of thermal change⁴⁸. F_{ST} and F_{IS} were computed per population in FSTAT 3.2⁴⁹. Significance of F_{IS} values were estimated by running 800 permutations of alleles among individuals for each population and a 5% indicative adjusted nominal level of P = 0.00125. Patterns of genetic structure were inferred by the Bayesian clustering method implemented in STRUCTURE v2.3.4 (<https://web.stanford.edu/group/pritchardlab/structure>) allowing admixture and independent allele frequencies enabling individuals to be assigned to different genetic groups if admixed⁵⁰. This method is based on a Markov chain Monte Carlo (MCMC) approach to optimise genotypic equilibrium (linkage equilibrium and HWE) within each cluster. For a K (likely number of genetic clusters) ranging from 1 to 4, with no geographic prior, 10 independent runs were conducted with a burn-in period of 100,000 steps and 500,000 MCMC replications. Both mean log likelihood L(K) and ΔK were used to estimate the likely number of clusters and obtained on Structure Harvester⁵¹. Final bar plots were generated with the POPHELPER Structure Web App⁵² with the alignment of the assignment scores obtained over the ten runs for each K. Discriminant analyses of principal components (DAPCs) were computed using the R package *adegenet*⁵³. This technique is used to maximise the inter-group component of variation of a principal component analysis and visually explore major genetic patterns among populations before and after the MHW. We retained 25 principal components out of the 69 (chosen as the amount of retained principal components for which the % cumulative variance slows as well as the spline interpolation from the alpha score optimisation implemented on *adegenet*) and 7 linear discriminants. The Bayesian informative criterion (BIC) was minimal for K = 8 which corresponds to the number of sampled populations when differentiating before from after. For every DAPC, loci contributions have allowed us to better identify the loci and alleles driving the observed changes in allelic frequencies between populations. Global analysis of molecular variance (AMOVA) weighted over loci was performed in ARLEQUIN using 1,000 permutations to statistically assess the differences amongst clusters. Given our unbalanced design with extirpation of kelp populations at Kalbarri and genetic change largely attributable to one site, we chose to do AMOVAs separately on data before and after the heatwave. Locus-by-locus outputs were investigated to look for main loci contributions. Pairwise F_{ST} tests were used to examine site differences before and after the heatwave.

Detections of recent mass mortality due to drastic effective reductions in response to extreme events such as MHW can be inferred by a heterozygosity excess compared to the expected heterozygosity based on the observed number of alleles⁵⁴. Conversely, heterozygote deficiency is a sign of expansion. Comparisons between expected heterozygosity under HWE and the expected heterozygosity computed from the actual observed number of alleles under the assumption of mutation-drift equilibrium were performed using the two-phase model (TPM) on the BOTTLENECK v1.2.02 software⁵⁵ (<https://www1.montpellier.inra.fr/CBGP/software/Bottleneck/bottleneck>) recommended for microsatellite data⁵⁴ and was run for 1,000 iterations with a variance among multiple steps in TPM equal to 12⁵⁵. The Wilcoxon test was used to depict significant heterozygosity deficiency and only the resulting P values were presented in Table 1. Isolation by distance (IBD) among populations was tested using a Mantel test implemented in IBD v. 1.5⁵⁶ to test for an association between linearised pairwise population genetic differences (F_{ST}/(1 – F_{ST})) and coastal distance.

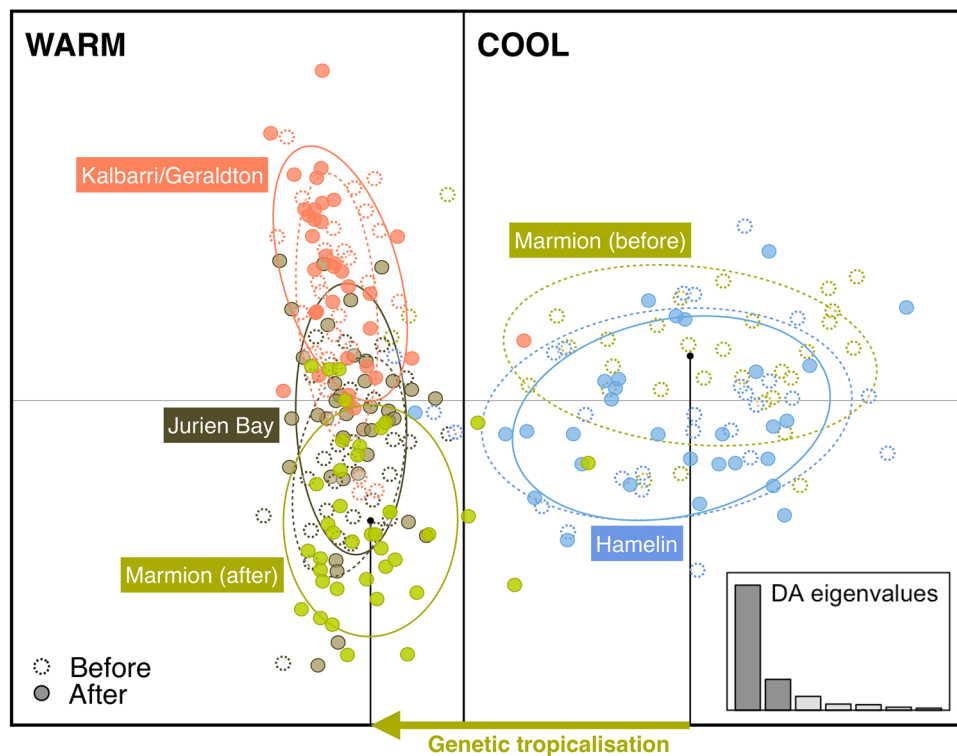


Figure 3. Discriminant analysis of principal components (DAPC) before (dashed symbols) and after (solid symbols) the heatwave. Each dot represents an individual while populations are represented by a coloured circle (the circumference of the ellipsis is arbitrary). The amount of genetic variation explained by the first two linear discriminants (DA) are 67.01 and 16.54%.

Results

Contrary to our prediction, there was no wholesale loss of genetic diversity within the footprint of the marine heatwave, with all diversity metrics remaining relatively constant (Table 1). The exception was genetic diversity (measured as expected heterozygosity and MLH) at Marmion which suffered a 24 and 31% decline respectively (Table 1). Diversity at the new range edge (Geraldton; only sampled after) was one of the lowest and was similar to the old range edge (Kalbarri) where kelp was completely extirpated. Jurien Bay and Hamelin both slightly increased genetic diversity by 4–12% (He) and 21–7% (MLH) respectively due to a gain of alleles overall. After the heatwave, Hamelin gained several new alleles that were previously only found in low latitude sites (e.g. EC10 allele 236, EC12 allele 169 and Eradic 10 allele 451 and 454; Supplementary Table S1). Jurien Bay gained 7 new alleles after the heatwave which were previously characteristic of both low and higher latitude sites. The presence of private alleles both before and after the heatwave may be used as an indicator of population stability. At Hamelin, 43% of private alleles remained after the heatwave relative to only 17–25% at Marmion and Jurien Bay (Table 1; Supplementary Table S1). The inbreeding coefficient (F_{IS}) became significantly positive at Marmion and Jurien Bay after the heatwave indicating that these sites became inbred (Table 1). Moreover, at Marmion there was a significant deficiency of heterozygotes after the heatwave indicative of recent population expansion following a ~25% cover loss⁶.

Populations of kelp contained 2 genetic clusters both before and after the heatwave (Fig. 2; $K=2$ inferred from delta K). However, the spatial composition of those clusters changed after the heatwave. Marmion shifted from being within a “cool” genetic cluster of genotypes characteristic of high latitude sites to an inbred “warm” allele cluster characteristic of genotypes from low latitude sites (Table 1, Figs. 2, 3) after the heatwave. That is, prior to the heatwave, Marmion grouped with the other high latitude (cool) site (Hamelin) but after the heatwave it became part of the low latitude (warm) cluster containing Jurien Bay and Geraldton (Figs. 2, 3). As such, there was significant genetic differentiation at Marmion from before to after the heatwave ($F_{ST}=0.112$) and this temporal difference was ~8 times greater than the same temporal comparison between any other pair of sites (Table 2).

The DAPC plot mirrors this pattern showing that Marmion shifted to being more closely related to Jurien Bay and Kalbarri (before) and Geraldton after the heatwave. Moreover, Jurien Bay appears to have become slightly more similar to Kalbarri/Geraldton in the DAPC plot after the heatwave (overlapping inertia ellipses; Fig. 3) concurrent with a drop in the pairwise F_{ST} estimate between these sites (Table 2) indicating that the kelp population at Jurien Bay became more genetically similar to its low latitude (warm) neighbours. There was also a slight temporal shift in genetic differentiation at Jurien Bay from before to after the heatwave (significant only at $P<0.01$, Table 2). Kalbarri/Geraldton and Hamelin did not show any significant temporal change in genetic differentiation from before to after the heatwave (Table 2). The pattern of isolation by distance (IBD) became

Before	Kalbarri	—							
	Jurien Bay	0.043	—						
	Marmion	0.121	0.124	—					
	Hamelin	0.118	0.096	0.019	—				
After	Geraldton	0.012	0.043	0.119	0.114	—			
	Jurien Bay	0.037	0.018	0.110	0.094	0.032	—		
	Marmion	0.064	0.024	0.112	0.083	0.060	0.036	—	
	Hamelin	0.113	0.103	0.015	0.010	0.110	0.099	0.091	—
	Kalbarri		Jurien Bay	Marmion	Hamelin	Geraldton	Jurien Bay	Marmion	Hamelin

Table 2. Pairwise F_{ST} estimates between pairs of sites before (blue) and after (red) the heatwave as well as comparisons between each site (pink) and different sites (no shading) before to after the heatwave event. Values in bold are significant after the Bonferroni correction ($P < 0.001$). Values in bold are significant after the Bonferroni correction ($P < 0.001$).

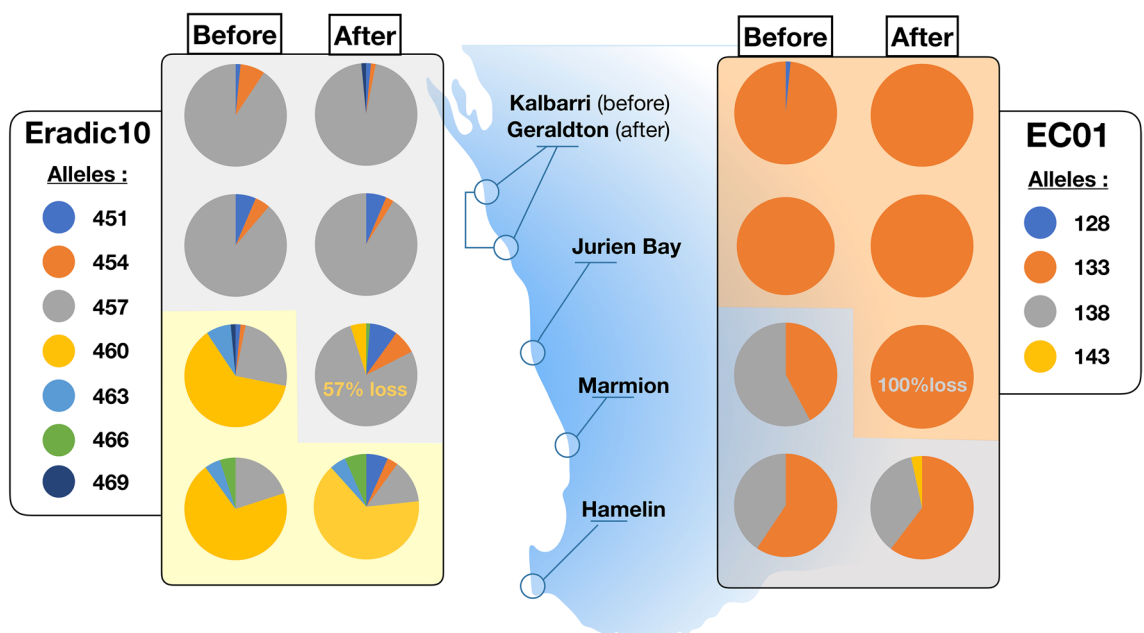


Figure 4. Examples of change in allelic frequencies of two microsatellite loci contributing to genetic tropicalisation at Marmion [Eradic10 ($n = 26-40$) and EC01 ($n = 30-40$)]. Background shading represents the northern and southern clusters identified from STRUCTURE (v 2.3.4; <https://web.stanford.edu/group/pritchardlab/structure>) ($K = 2$; Fig. 3) and are coloured according to the major allele frequency driving change from before to after. The percent loss of the major “cool” alleles (460 and 138) at Marmion is also shown.

highly significant after the heatwave (Mantel tests $Z = 691.70$, $r = 0.92$, $P < 0.001$) but was not significant before (Mantel tests $Z = 500.99$, $r = 0.40$, $P = 0.17$).

This striking shift at Marmion from the cool to warm genotype cluster was driven by clear shifts in allele frequencies at many loci (Fig. 3, Supplementary Fig. S1). Notably, Eradic10 had the greatest contribution to separation of warm and cool clusters on DAPC axes (Fig. 3, Supplementary Fig. S1). For this locus, allele 457, which was largely characteristic of the low latitude (warm) cluster (Kalbarri/Jurien Bay), became the dominant allele at Marmion after the heatwave, concurrent with a decline in the frequency of allele 460, which was overwhelmingly dominant in the higher latitude (cool) cluster before (Marmion and Hamelin) and after (Hamelin) the heatwave (Fig. 4). Similarly, alleles 133 and 138 of EC01 showed significant change at Marmion after the heatwave (Fig. 3, Supplementary Table S3) and allele 184 of EC12 also contributed to the shift at Marmion (Supplementary Table S3). Locus by locus AMOVA confirmed that Eradic10 and EC01 loci drove 42–50% (Eradic10) and 31–49% (EC01) of genetic variation between the 2 STRUCTURE clusters before and after the heatwave (Supplementary Material, Supplementary Table S2).

Discussion

Marine heatwaves are increasing globally with devastating ecological consequences, but the impacts on underlying genetics of species and populations are poorly understood. Using very rare “before” genetic samples we empirically demonstrate that an extreme marine heatwave was associated with significant change in kelp forest genetic diversity and structure. Contrary to our prediction, there was no wholesale loss of genetic diversity within the footprint of the marine heatwave despite great loss of kelp in some sites. Along the entire coast of Western Australia, however, the heatwave drove kelp populations to become more genetically distinct with a significant increase in isolation by distance. Moreover, the heatwave led to replacement of cool-water alleles by warm-water alleles across 200 km of coastline, representing a clear and unprecedented “genetic tropicalisation”.

Genetic tropicalisation of kelp forests. Tropicalisation is traditionally defined as an increase in relative abundance of warm-water species²⁴ in cool-water ecological communities and is a well-documented response to warming in the ecological literature^{57–59}, including in this study area following the marine heatwave⁶. However, to our knowledge this is the first time that a similar phenomenon has been demonstrated to extend to the molecular level. After the heatwave, Marmion shifted from a “cool” genetic cluster characteristic of high latitude sites to an inbred “warm” genetic cluster characteristic of low latitude sites. This striking change was driven by clear shifts in allele frequencies at a number of loci, whereby alleles largely characteristic of the low latitude (warm) cluster prior to the heatwave, became the dominant alleles at Marmion after the heatwave, concurrent with a decline in alleles which were overwhelmingly dominant in the higher latitude (cool) cluster. Thus, we define these changes as “genetic tropicalisation”. This phenomenon is a specific case of a hybrid zone, whereby populations at the interface of species or genetic clusters periodically mix to various degrees^{60–62} which can also be climate mediated⁶².

Genetic tropicalisation at Marmion was likely facilitated by mortality of kelp that occurred as a direct result of the heatwave⁶. Kelp recruitment is often low within dense canopies and turnover largely reliant on the change in physical conditions created as kelp density thins or gaps are created following mortality or loss of adult plants^{63,64}. Indeed, Marmion initially suffered ~25% decline in kelp cover due to the direct physiological effects of the heatwave⁶ which likely exceeded or approached the thermal tolerance of kelp and co-occurring seaweed species^{6,65,66}. This opened up space for rapid recruitment by either (1) locally surviving ‘warm’ genotypes²⁰ or (2) propagules transported from lower latitudes assisted by the increased poleward flow of prevailing currents^{35,67} at the time of the heatwave³¹. These scenarios of recolonization are not mutually exclusive and likely occurred together, although our microsatellite data can only provide definitive evidence for the latter. If genetic tropicalisation was a result of proliferation of surviving warm genotypes at Marmion it would imply there was selection against ‘cool’ genotypes. While this may indeed have occurred, selection cannot be inferred from neutral microsatellite data. Nevertheless, Marmion suffered the greatest loss of genetic diversity of any site (24–31% of expected and multi-locus heterozygosity), suggesting that there could have been some selection. Moreover, Marmion became inbred after the heatwave suggesting that breeding was among a smaller pool of surviving genotypes rather than a large influx of new ones. Regardless of the mechanism driving the change, the timing of the heatwave during the peak reproductive season for *Ecklonia*⁶⁸, meant that the genetic tropicalisation signal was likely rapidly entrenched. The rapid recovery of kelp canopy cover at Marmion would have prevented any further major genetic turnover because the ecological driver of such turnover (gaps in the canopy that facilitate recruitment of local or foreign genotypes) was removed. Indeed, this genetic tropicalisation signal was evident even 7 years after the heatwave.

For other sites for which we had before and after data (Hamelin and Jurien Bay) there was only a small genetic effect of the heatwave. Genetic diversity at Hamelin slightly increased, gaining a number of low frequency alleles characteristic of low latitude (warm) sites. Despite experiencing similarly large thermal anomalies, we contend that Hamelin only experienced mild genetic change because there was largely no mechanism for this process to occur. Hamelin did not experience significant loss of kelp during the heatwave presumably because its thermal threshold was not crossed²⁴ nor has it shown any evidence of ecological tropicalisation^{6,24}, implying that no space was opened up for significant genetic turnover to occur. Indeed, the relatively greater stability of private alleles at Hamelin and presence of the lowest pairwise F_{ST} estimates between times of sampling indicate little genetic turnover at this site.

Interestingly, there was only a small genetic effect of the heatwave at Jurien Bay, despite great loss of kelp cover (50–60%) and strong ecological tropicalisation^{6,24}. While this loss provides a mechanism for genetic turnover, a large shift in neutral alleles could not take place as Jurien Bay was already part of the low latitude cluster and dispersal along this coast is predominately poleward^{35,67} with few remaining populations further north. Thus, recolonization following loss of kelp would not leave a genetic signature because recruits would most likely be sourced from within the same genetic cluster. Nevertheless, F_{IS} became significant at Jurien Bay after the heatwave indicating inbreeding and Jurien Bay became slightly more similar to Kalbarri/Geraldton on the DAPC plot after the heatwave concurrent with a drop in the pairwise F_{ST} estimate between these sites indicating that the kelp population at Jurien Bay became slightly more genetically similar to its low latitude (warm) trailing edge neighbours, possibly a mild tropicalisation signal.

Although the correlative nature of this study and lack of more temporal replication means that we cannot definitively demonstrate that the heatwave caused the genetic changes seen here, genetic change seen in other seaweed species and markers following the heatwave is strong evidence to suggest that the heatwave did mediate genetic tropicalisation²⁰. Two co-occurring forest forming species *Scytothalia dorycarpa* and *Sargassum fallax*²⁹, both showed strong declines in haplotype diversity following the heatwave²⁰ with *Scytothalia* being completely extirpated from Jurien Bay²⁵. Moreover, there were some signs of possible directional selection for *Sargassum* with specific genotypes dominating after the heatwave²⁰. Nevertheless, genetic change from before to after the

heatwave could also be simply due to one of many temporally stochastic processes that influence genetic turnover in populations. For example, temporal variation in oceanography⁶⁹, reproductive success⁷⁰, ecological processes (e.g. herbivory) or post-recruitment survival of different genotypes may result in significant temporal genetic change. Unfortunately there exist very few temporally replicated genetic datasets, particularly for seaweeds, to tease apart the role of such stochastic processes in driving genetic change⁷¹. The few existing temporally replicated seaweed studies show contrasting results. For example, *Fucus serratus* populations sampled 10 years apart across Europe, showed temporal genetic stability⁴⁸ except in warm range edge populations that were thermally stressed. These populations experienced a 90% decline in abundance and greater homozygosity (decline in MLH), possibly as a result of selection favouring thermal tolerance⁴⁸. Conversely, an extreme event (earthquake) in Chile resulted in a decline in *Agarophyton chilense* genetic diversity (loss of rare alleles) immediately following the event, but recovery occurred after 2 years⁷². Given the weight of evidence we present here and across multiple species and genetic markers²⁰, we find it likely the heatwave was responsible for the observed genetic changes. However, proper understanding of the genetic impacts of climate change and extreme events for marine organisms will require temporally replicated studies and efforts to collect baseline data from which to measure change.

Kelps possess a microscopic gametophyte stage which may be able to tolerate different environmental conditions than sporophytes and potentially act as a short term 'bank of microscopic forms' for recolonisation following stressors⁷³. Genetic studies have shown that these banks can also be of mixed origin and age which maximises genetic diversity of recolonising populations⁷⁴. Given that gametophytes of *E. radiata* appear to have broad thermal tolerances with lethal upper limits that are generally in excess of temperatures experienced in the field³⁰, it is possible that recovery following heatwave-induced mortality of macroscopic sporophytes was partly from such a bank of microscopic forms. Recovery from a genetically diverse, mixed age or origin bank could explain the general maintenance of genetic diversity across most sites, even where there was large loss of canopy cover (Jurien). Moreover, recovery from an existing bank at Marmion may have dampened the impact of increased gene flow from lower latitudes. However, the difficulties in finding and sampling gametophytes in natural settings mean that large knowledge gaps remain regarding their role in population recovery following extreme events and kelp forest population genetics more generally.

The future of kelp forests. It is interesting to speculate whether populations at Marmion are now more thermally tolerant than before the heatwave. Properly identifying adaptation in complex natural systems is a challenging task^{75,76} and is outside the scope of this study. Nonetheless, while our study used neutral microsatellite markers and can only definitively infer change in gene flow, it is plausible that, because lower latitude populations had a greater thermal tolerance than higher latitude populations prior to the heatwave⁷⁷, this greater tolerance would now be seen in Marmion due to an increase in low latitude "warm" genotypes. Given that reduction in temperature sensitivity of metabolic processes from cool- to warm-adapted populations has previously been demonstrated for several seaweed species along this coastline⁷⁷ (a mechanism to help constrain temperature-driven effects on net carbon balance), we find this scenario likely. Unravelling whether the changes seen here in neutral microsatellite markers are reflected in those under selection (adaptive markers), along with manipulative experiments to assess thermal tolerance of different genotypes will be key for predicting future vulnerability of these kelp forests to ongoing climate change.

It has been 9 years since the marine heatwave and while the lowest latitude kelp forests in Kalbarri have not yet recovered⁷⁸, genetic signs of population expansion at Geraldton and Marmion (Table 1) suggest that recovery and recolonization at these sites is ongoing and a long-term process. While encouraging, the frequency of marine heatwaves is projected to increase¹² and warm low latitude populations remain somewhat vulnerable due to inbreeding coupled with genetic erosion⁷⁹, factors which may undermine long term adaptive capacity.

Global kelp loss has prompted calls for more interventionist management approaches to actively ensure long-term persistence against climate change^{80,81}. In the case of Australian kelp forests, the use of interventionist measures may be one of the few routes left to address the alarming predicted range contraction of *Ecklonia* and extinction of other seaweeds^{80,82,83}. These strategies include assisted adaptation and evolution, which are founded on the concept that incorporating stress tolerant genes or genotypes into extant populations can boost their resilience to future change⁸³. This highlights a pressing need to identify where and when one may find such tolerant individuals and populations to apply such approaches. We suggest that extreme events may provide a natural laboratory for identifying tolerant populations or genotypes that could be targeted and utilised in assisted adaptation approaches. Recognising these potentially positive benefits of extreme events may present new opportunities to "future-proof" ecosystems against climate change.

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Author contributions

M.A.C. conceived the idea. M.A.C., T.W. and S.V. collected the samples. A.J.P.M. and M.A.C. analysed the samples and data. M.A.C. and A.J.P.M. wrote the paper and all authors edited the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

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